



CAPE-OPEN Numerical Solver Interfaces

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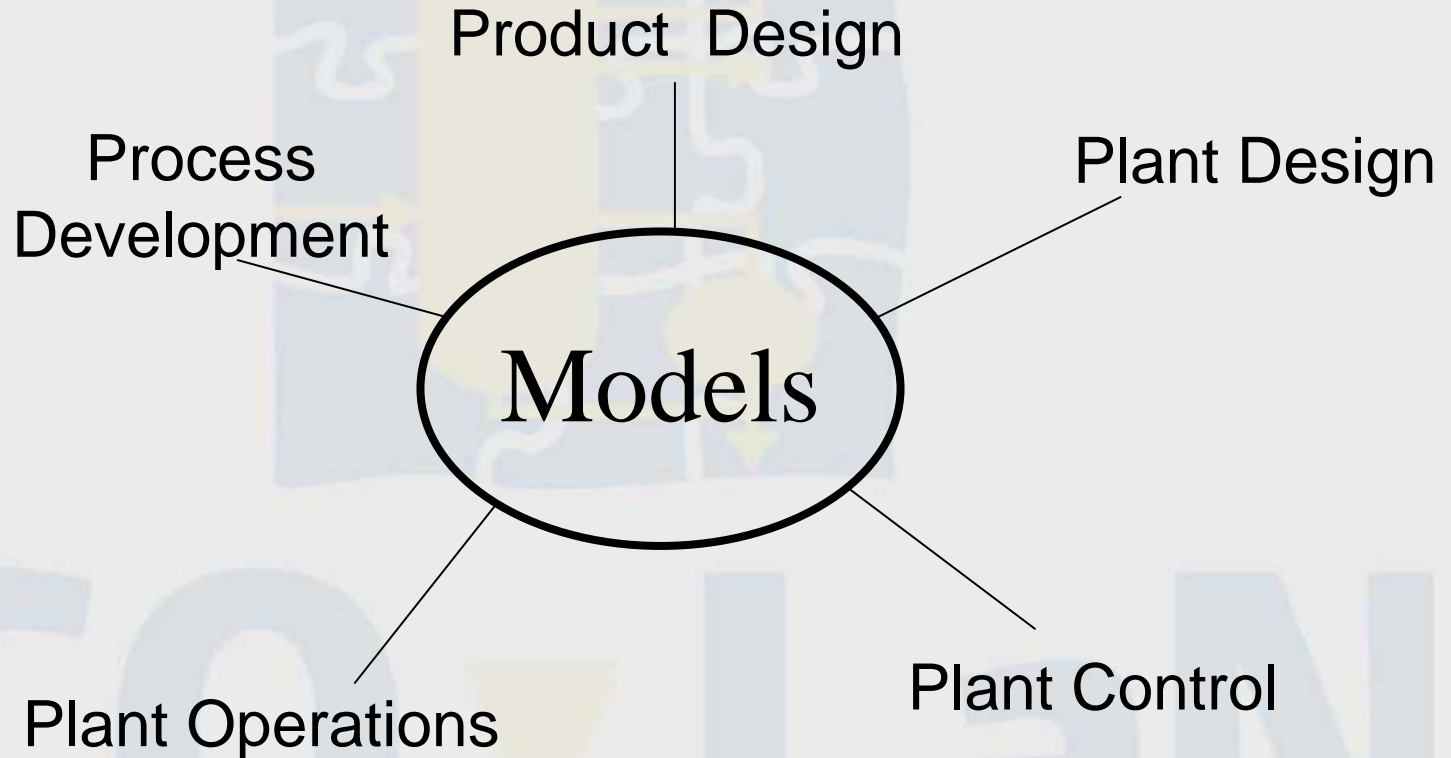
Overview

- ◆ **Background and scope of CAPE-OPEN Numerical Solvers**
- ◆ **The challenge**
- ◆ **General principles of CAPE-OPEN Numerics interfaces**
- ◆ **Illustration – implementing simple nonlinear solver**
- ◆ **Concluding remarks**

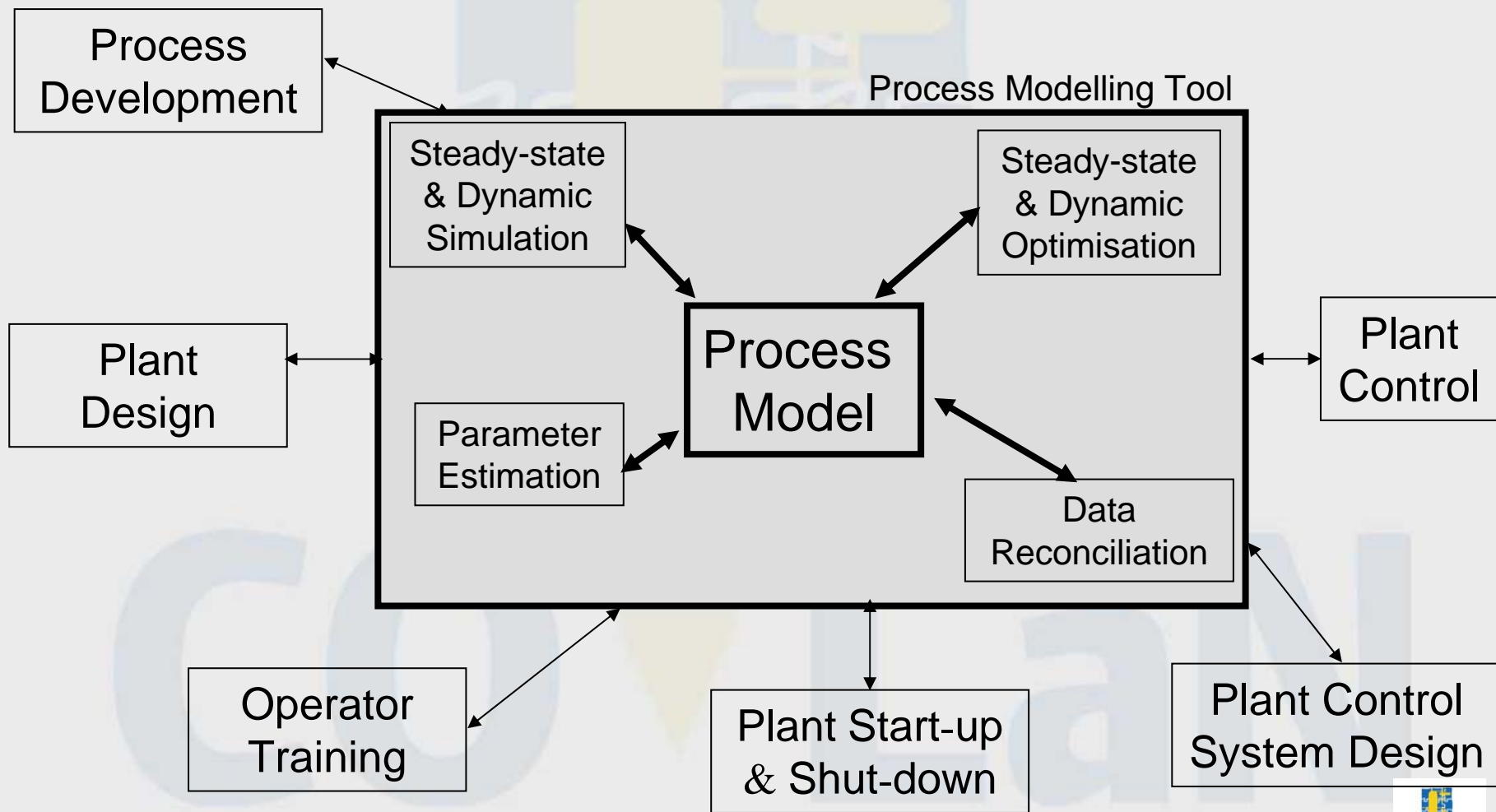
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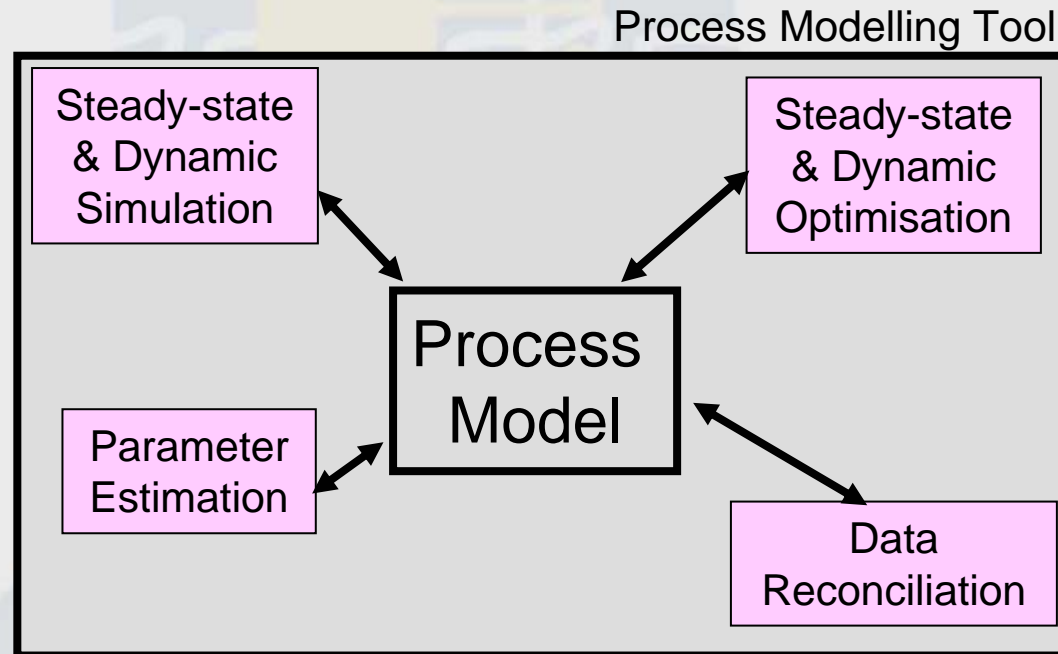
Model-centric process engineering



General-purpose process modelling tools



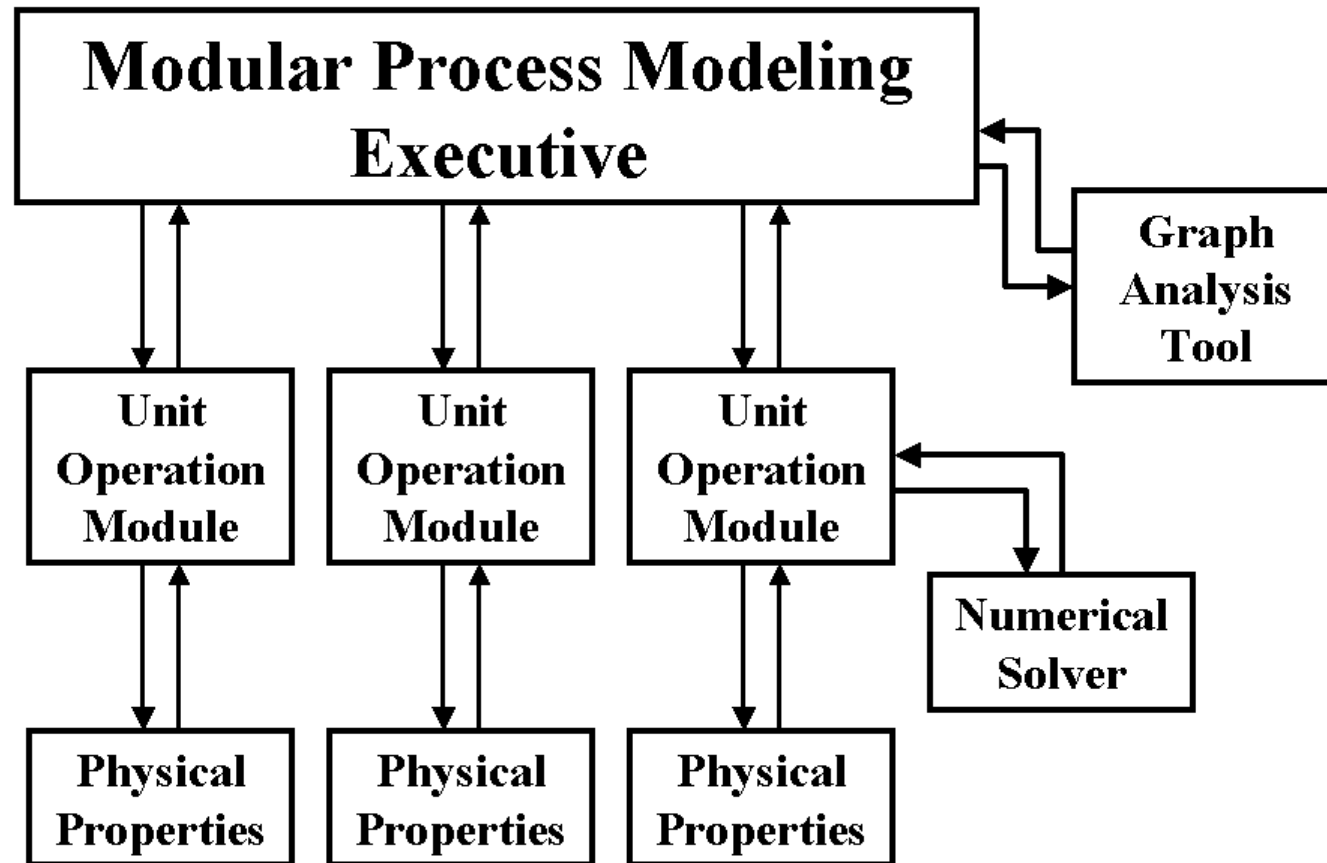
Core model-based activities



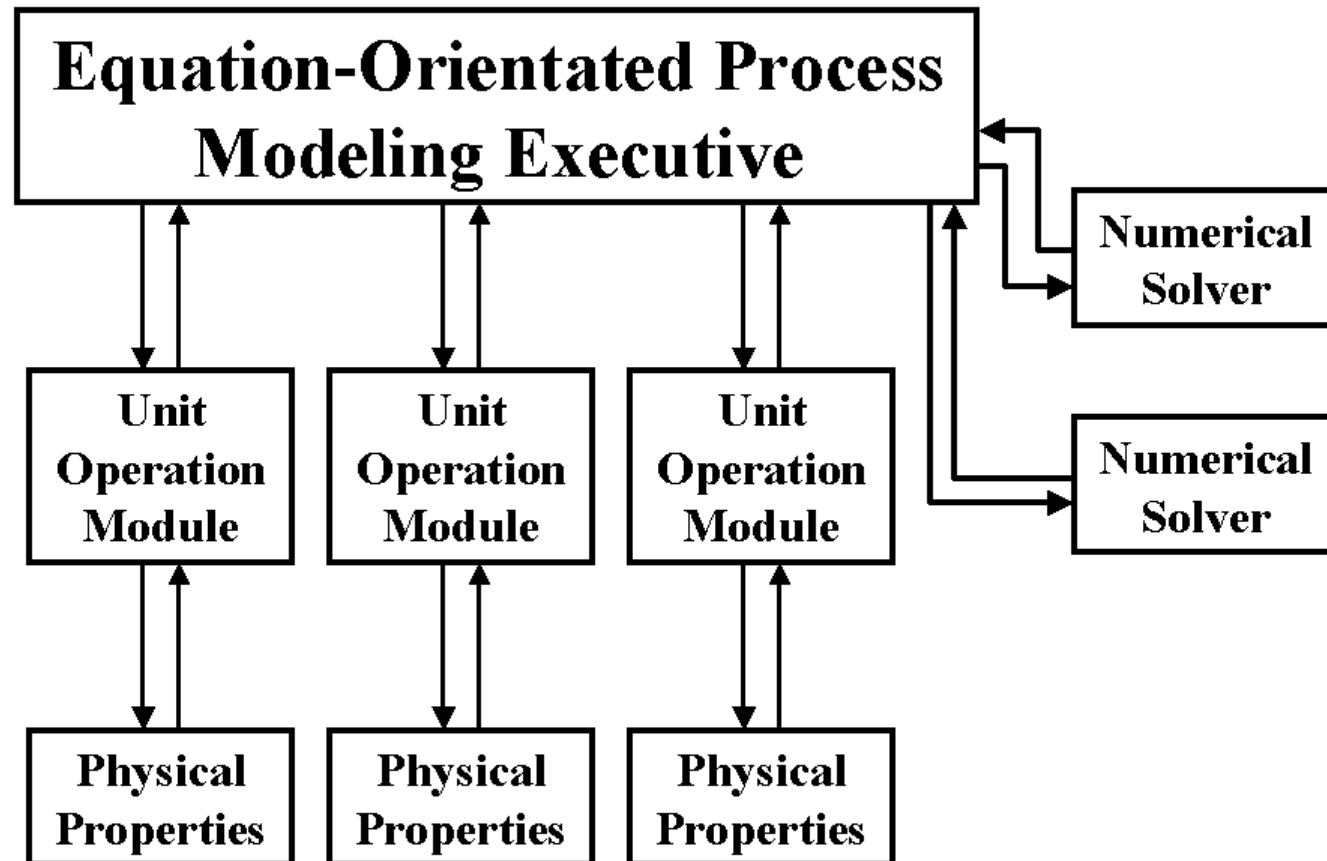
CAPE-OPEN scope for numerical solvers

- ◆ **Variety of core model-based activities**
 - ⇒ **Steady-state & dynamic simulation**
 - ⇒ **Steady-state optimisation**
 - ⇒ **Parameter estimation and data reconciliation**
- ◆ **Both “modular” and “equation-orientated” systems**
- ◆ **Emphasis on “large-scale” problems**

Typical modular process modelling tool



Typical Equation-Orientated process modelling tool



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A wide variety of mathematical problem types depending on application

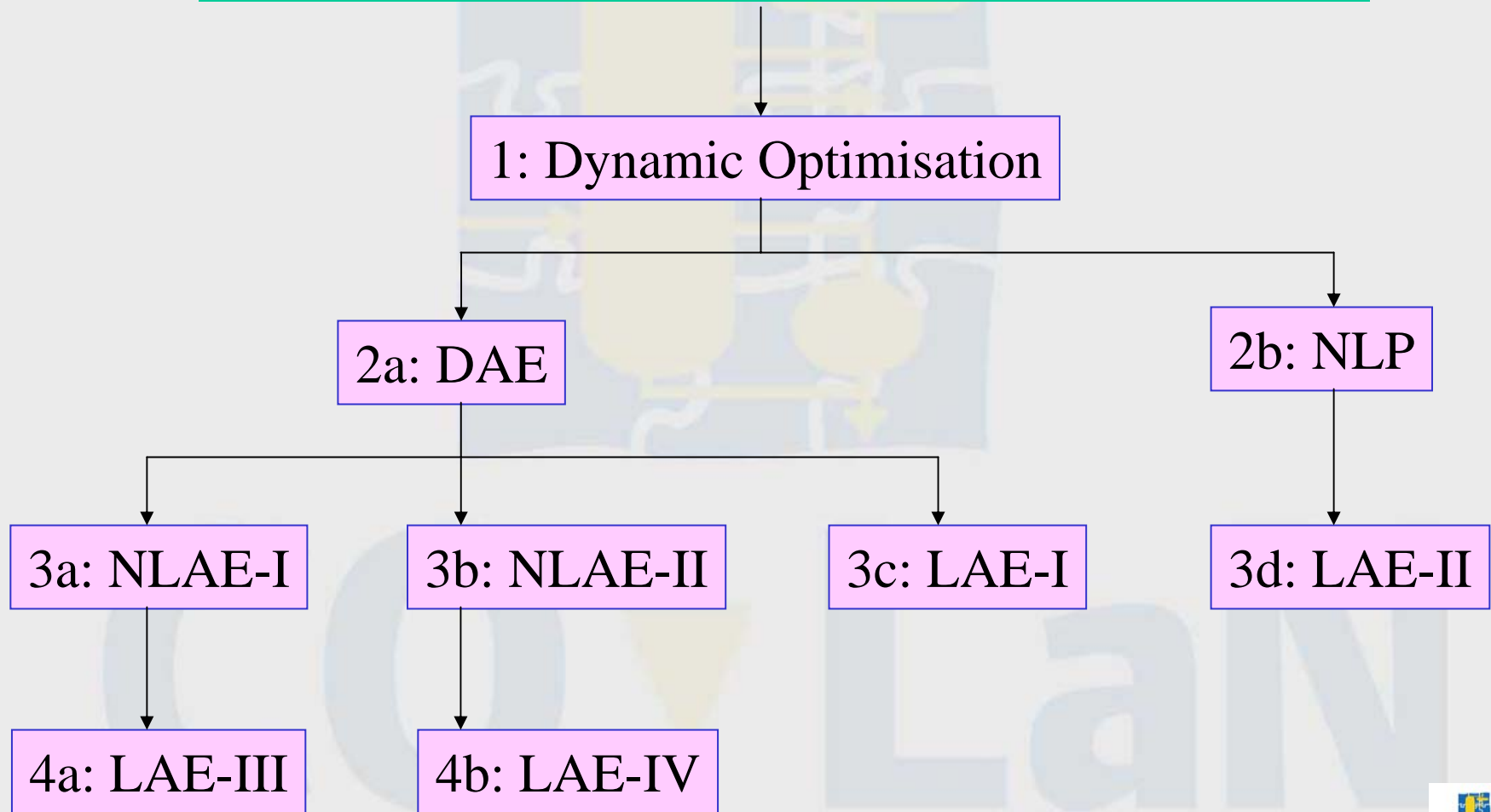
- ◆ **Steady-state simulation**
 - ⇒ Sets of nonlinear algebraic equations
 - ⇒ Sets of integral, partial differential and algebraic equations
- ◆ **Dynamic simulation**
 - ⇒ Sets of differential & algebraic equations
 - ⇒ Sets of integral, partial differential and algebraic equations
- ◆ **Plant design**
 - ⇒ (mixed integer) nonlinear programming
 - ⇒ (mixed integer) dynamic optimisation
- ◆ **Plant operation and control**
 - ⇒ Linear programming
 - ⇒ Nonlinear programming
 - ⇒ Dynamic optimisation
- ◆ **Production planning & scheduling**
 - ⇒ (mixed integer) linear programming

A hierarchy of solvers

- ◆ To do steady-state simulation of a distillation column
 - ⇒ we need to solve sets of nonlinear algebraic equations...
 - which involves solving linear equations...
- ◆ To optimise the grade transition in a polymerisation reactor
 - ⇒ we need to solve a dynamic optimisation problem
 - which involves solving sets of DAEs
 - which involves solving linear algebraic equations
 - ...and also solving nonlinear algebraic equations (2 different types)
 - » which involves solving linear equations
 - .. and also nonlinear programming problems
 - which involves solving (more) linear equations...

Solver hierarchies

Activity: optimise the dynamic response of a unit



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CAPE-OPEN objectives for numerical solvers

- ◆ Allow the usage of solvers from different sources to perform all the activities supported by process modelling tools
 - ⇒ complete “mix-and-match”
 - ⇒ ...at *any* point in the hierarchy
 - ⇒ ...not just at the top activity level
- ◆ Provide access to the mathematical statements of the models
 - ⇒ allows the construction of third-party software to perform activities that are *not* directly supported by process modelling tools
 - e.g. model-based fault detection

CAPE-OPEN Problem Objects

- ◆ **Fundamental principle: complete separation between**
 - ⇒ the description of the problem being solved
 - ⇒ the code used for its solution
- ◆ **Describe different types of mathematical problems as different software object classes with formally defined interfaces**

Mathematical Problem Type	CAPE-OPEN Problem Object
Nonlinear algebraic equations	Equation Set Object (ESO)
Differential-algebraic equations	Differential Algebraic ESO (DAESO)
Partial differential-algebraic equations	Partial Differential Algebraic ESO (PDAESO)
Mixed integer nonlinear programming problems	minlp object



CAPE-OPEN System Factories & Systems

- ◆ Classify numerical solvers into different categories
 - ⇒ Nonlinear algebraic equation solvers
 - ⇒ Differential-algebraic equation solvers
 - ⇒
- ◆ Each CO-compliant solver provides a Solver Manager
- ◆ A CO System can be constructed by applying a CO Solver Manager to a CO Problem Object

$$\left\{ \begin{array}{c} \text{CAPE - OPEN} \\ \text{System} \end{array} \right\} \equiv \left\{ \begin{array}{c} \text{Problem} \\ \text{being solved} \end{array} \right\} + \left\{ \begin{array}{c} \text{Numerical code} \\ \text{used for solution} \end{array} \right\}$$

CAPE-OPEN Systems

$$\left\{ \begin{array}{c} \text{CAPE - OPEN} \\ \text{System} \end{array} \right\} \equiv \left\{ \begin{array}{c} \text{Problem} \\ \text{being solved} \end{array} \right\} + \left\{ \begin{array}{c} \text{Numerical code} \\ \text{used for solution} \end{array} \right\}$$

- ◆ Each CAPE-OPEN System has method(s) for solving the problem
- ◆ Final solution of the problem is placed in the CO Problem Object

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CAPE-OPEN: how to solve a numerical problem

♦ Example:

⇒ Do a steady-state simulation of a distillation column

CAPE-OPEN: how to solve a numerical problem

- ◆ **Step 1: Construct a CO Problem Object**
 - ⇒ e.g. an Equation Set Object containing the column equations, `columnESO`
- ◆ **Step 2: Obtain a CO-compliant Solver Manager for an appropriate solver**
 - ⇒ e.g. the BDNLSOL solver from PSE Ltd., `bdnlsolMGR`
- ◆ **Step 3: Pass the Problem Object to the Solver Manager to obtain a CO System**
 - ⇒ e.g. `mySystem = bdnlsolMGR->CreateNLSystem(columnESO);`
- ◆ **Step 4: Ask the System to solve itself**
 - ⇒ e.g. `mySystem->Solve();`
- ◆ **Step 5: Retrieve the solution from the CO Problem Object**
 - ⇒ e.g. `X = columnESO->GetVariables();`

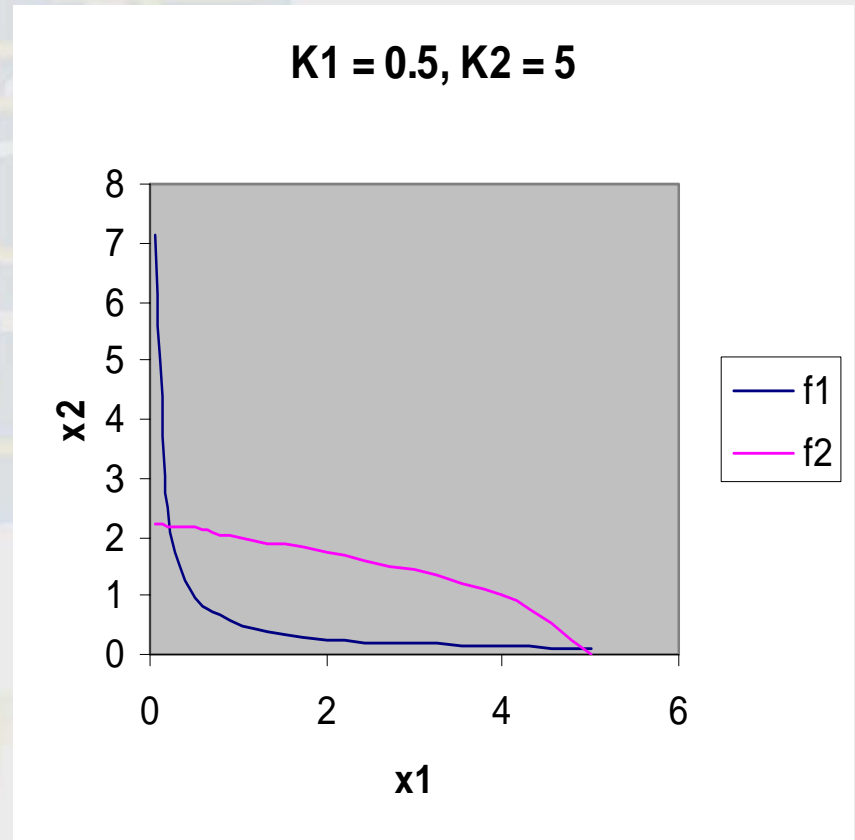
Under the hood – interaction between solver and ESO

- ◆ Excursion – nonlinear solver for specific problem
- ◆ Next stage of generalisation – hand-coded user functions
- ◆ Finally – the ESO: no coding!

Example problem

$$x_1 + x_2^2 = K_1$$

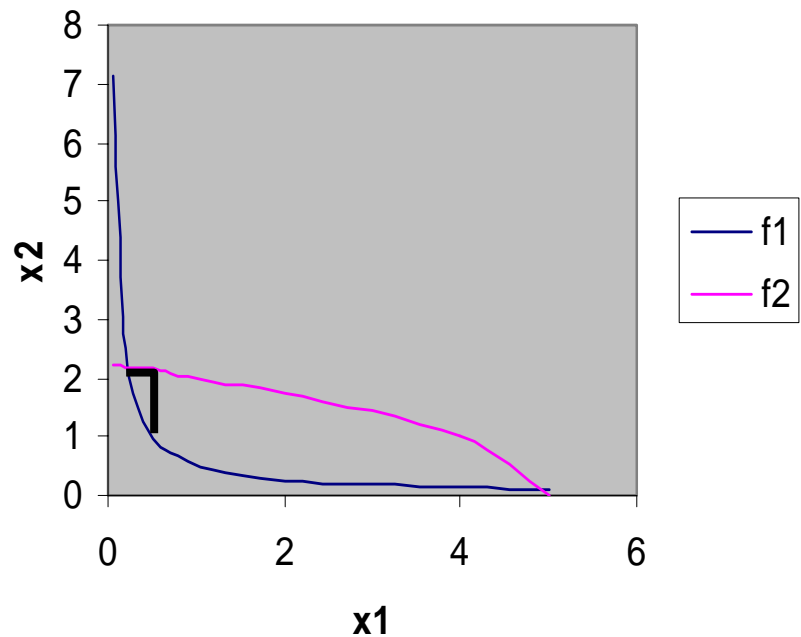
$$x_1 x_2 = K_2$$



Stage 1: specifically coded solution

```
void solve(double x1, double  
    x2,    double k1, double k2)  
// initial guess  
x1 = sqrt(k2)  
// Iteration  
Int iter = 0  
Repeat  
    x2 = sqrt(k1 - x1)  
    x1 = k2/x2  
Until abs(k1 - x1 - x2^2) <  
    eps  
    OR iter = itermax
```

$K1 = 0.5, K2 = 5$



Stage 2: Hand-coded user functions...

◆ Residuals:

```
void f(double x[], double k[], double r[])  
    r[0] = x[0] + x[1]^2 - k[0]  
    r[1] = x[0] * x[1] - k[1]
```

$$x_1 + x_2^2 = K_1$$

$$x_1 x_2 = K_2$$

◆ Jacobian:

```
void j(double x[], double k[], double  
    A[][])  
    A[0][0] = 1  
    A[0][1] = 2 * x[1]  
    A[1][0] = x[1]  
    A[1][1] = x[0]
```

... but general solver

◆ Nlsolve(x[], double k[])

```
double A[neq][nvar]
double r[neq], delta[nvar]
niter = 0
Repeat
    call f(x, k, r)
    call j(x, k, A)

    call linsolve(A, r, delta)

    x = x - delta; niter++

Until abs(delta) < eps OR niter = itermax
```

Stage 3: Use the ESO

◆ Residuals:

```
void f(double x[], double k[], double r[])  
    GlobalVarSet.SetAssignedVariables(k);  
    UnknownsVarSet.SetAllVariables(x);  
    ESO.GetAllResiduals(r);
```

◆ Jacobian:

```
void j(double x[], double k[], double A[][])  
    GlobalVarSet.SetAssignedVariables(k);  
    UnknownsVarSet.SetAllVariables(x);  
    ESO.GetAllJacobianElements(A);
```

Note on ESO Implementation

- ◆ Basic idea is to treat equations (and derivatives) as data
- ◆ “Data” can now take the form of generated machine code, for speed
- ◆ Not necessary for solver to access symbolic form: only structure, residuals and Jacobian values

Stage 4: Componentise solver

- ◆ All solvers have this interface:

```
interface ICapeNumericSolverComponent :  
    ICapeUtilityComponent {  
        CapeSolverType GetType();  
        void SelfDestruct();  
        CapeArrayInterface GetParameters();  
        CapeInterface GetParameterByName(in CapeString name);  
        CapeArrayInterface GetStatistics();  
        CapeInterface GetStatisticByName(in CapeString name);  
    };
```

- ◆ NLASystem is created using an ESO, and just adds Solve();

Stage 4: Evolution

◆ Nlsolve(x[], double k[])

```
double A[neq][nvar]
double r[neq], delta[nvar]
niter = 0
Repeat
    call f(x, k, r)
    call j(x, k, A)

    call linsolve(A, r, delta)

    x = x - delta; niter++

Until abs(delta) < eps OR niter = itermx
```

Stage 4: Evolution

```
◆ SimpleSolver::Solve()  
  CapeArrayDouble_var x  
  m_UnknownVarSet->GetAllVariables(x)  
  double A[neq][nvar]  
  double r[neq], delta[nvar]  
  niter = 0  
  Repeat  
    call f(x, k, r)  
    call j(x, k, A)  
  
    call linsolve(A, r, delta)  
  
    x = x - delta; niter++  
    m_UnknownVarSet->SetAllVariables(x)  
  Until abs(delta) < eps OR niter = itermax
```

Stage 4: Evolution

```
◆ SimpleSolver::Solve()  
  CapeArrayDouble_var x  
  m_UnknownVarSet->GetAllVariables(x)  
  CapeArrayDouble_var A  
  CapeArrayDouble_var r, delta  
  niter = 0  
  Repeat  
    call f(x, k, r)  
    call j(x, k, A)  
  
    call linsolve(A, r, delta)  
  
    x = x - delta; niter++  
    m_UnknownVarSet->SetAllVariables(x)  
  Until abs(delta) < eps OR niter = itermax
```


Stage 4: Evolution

```
◆ SimpleSolver::Solve()  
  CapeArrayDouble_var x  
  m_UnknownVarSet->GetAllVariables(x)  
  CapeArrayDouble_var A  
  CapeArrayDouble_var r, delta  
  niter = 0  
  Repeat  
    call m_ESO->GetResiduals(r)  
    call j(x, k, A)  
  
    call linsolve(A, r, delta)  
  
    x = x - delta; niter++  
    m_UnknownVarSet->SetAllVariables(x)  
  Until abs(delta) < eps OR niter = itermax
```

Stage 4: Evolution

```
◆ SimpleSolver::Solve()  
  CapeArrayDouble_var x  
  m_UnknownVarSet->GetAllVariables(x)  
  CapeArrayDouble_var A  
  CapeArrayDouble_var r, delta  
  niter = 0  
  Repeat  
    call m_ESO->GetResiduals(r)  
    call m_ESO->GetJacobianValues(A)  
  
    call linsolve(A, r, delta)  
  
    x = x - delta; niter++  
    m_UnknownVarSet->SetAllVariables(x)  
  Until abs(delta) < eps OR niter = itermax
```

Stage 4: Evolution

```
◆ SimpleSolver::Solve()  
  CapeArrayDouble_var x  
  m_UnknownVarSet->GetAllVariables(x)  
  CapeArrayDouble_var A  
  CapeArrayDouble_var r, delta  
  niter = 0  
  Repeat  
    call m_ESO->GetResiduals(r)  
    call m_ESO->GetJacobianValues(A)  
    call m_LinSol->SetMatrixValues(A)  
    call m_LinSol->SetRHS(r)  
    call m_LinSol->GetSolution(delta)  
    x = x - delta; niter++  
    m_UnknownVarSet->SetAllVariables(x)  
  Until abs(delta) < eps OR niter = itermax
```

Stage 4: Evolution

```
◆ SimpleSolver::Solve()  
  CapeArrayDouble_var x  
  m_UnknownVarSet->GetAllVariables(x)  
  CapeArrayDouble_var A  
  CapeArrayDouble_var r, delta  
  niter = 0  
  Repeat  
    call m_ESO->GetResiduals(r)  
    call m_ESO->GetJacobianValues(A)  
    call m_LinSol->SetMatrixValues(A)  
    call m_LinSol->SetRHS(r)  
    call m_LinSol->GetSolution(delta)  
    x = x - delta; niter++  
    m_UnknownVarSet->SetAllVariables(x)  
  Until abs(delta) < eps OR niter = itermax
```

Parameter:
Linear
solver

Statistic:
actual
iterations

Parameter:
max
iterations

Parameter:
success
condition

Stage 5: Package for gPROMS

- ◆ Create a DLL (Windows) or shared object (Unix) with a single exported function, “init” – say MySimpNL.dll
 - ⇒ “init” function must return CORBA object reference to the solver’s SolverManager.
- ◆ Place DLL in gPROMS’ slv subdirectory.
- ◆ Tell gPROMS to use the solver:

SOLUTIONPARAMETERS

NLSolver:="MySimpNL";

Note: for truly interoperable solvers, need to standardise these details!

Additional example: MINLP solver

gPROMS Solution parameters:

```
DOSolver := "CVP_SS" [  
  "DASolver" := "DASOLV",  
  "MINLPSolver" := "OAERAP" [  
    "MaxIterations" := 10000,  
    "OptimisationTolerance" := 0.0001,  
    "MILPSolver" := "GLPK",  
    "NLPSolver" := "SRQPD"  
  ]  
]
```

Additional e

- Task: Dynamic Optimisation
- Interface: IgDOSolverManager
- Status: Standardisation candidate

gPROMS Solver parameters.

```
DOSolver := "CVP_SS" [  
  "DASolver" := "DASOLV",  
  "MINLPSolver" := "OAERAP" [  
    "MaxIterations" := 10000,  
    "OptimisationTolerance" := 0.0001,  
    "MILPSolver" := "GLPK",  
    "NLPSolver" := "SRQPD"  
  ]  
]
```

Additional example: MINLP solver

gPROMS

⊃ *Task*: Integration

⊃ *Interface*: ICapeNumericDAESolverManager

⊃ *Status*: Standard interface

```
DOSolver := "CVP_SS" [  
  "DASolver" := "DASOLV",  
  "MINLPSolver" := "OAERAP" [  
    "MaxIterations" := 10000,  
    "OptimisationTolerance" := 0.0001,  
    "MILPSolver" := "GLPK",  
    "NLPSolver" := "SRQPD"  
  ]  
]
```


Additional example: MINLP solver

gPROMS Solver

Task: MINLP

Interface: ICapeMINLPSolverManager

Status: Standard interface

```
DOSolver := "CVP_SS" [  
  "DASolver" := "DASOLV",  
  "MINLPSolver" := "OAERAP" [  
    "MaxIterations" := 10000,  
    "OptimisationTolerance" := 0.0001,  
    "MILPSolver" := "GLPK",  
    "NLPSolver" := "SRQPD"  
  ]  
]
```

Additional example: MINLP solver

gPROMS Solution parameters:

```
DOSolver := "CVP_SS" [  
    "DASolver" := "DASOLV",  
    "MINLPSolver" := "OAERAP" [  
        "MaxIterations" := 10000,  
        "OptimisationTolerance" := 0.0001,  
        "MILPSolver" := "GLPK",  
        "NLPSolver" := "SNOPT"  
    ]  
]
```

◉ **Task:** MILP

◉ **Interface:** ICapeMILPSolverManager

◉ **Status:** Standard interface

Additional example: MINLP solver

gPROMS Solution parameters:

```
DOSolver := "CVP_SS" [  
    "DASolver" := "DASOLV",  
    "MINLPSolver" := "OAERAP" [  
        "MaxIterations" := 10000,  
        "OptimisationTolerance" := 0.0001,  
        "MILPSolver" := "GLPK",  
        "NLPSolver" := "SRQPD"  
    ]  
]
```

⊙ **Task:** NLP

⊙ **Interface:** ICapeMINLPSolverManager

⊙ **Status:** Standard interface

Additional example: MINLP solver

gPROMS Solution parameters:

```
DOSolver := "CVP_SS" [  
  "DASolver" := "DASOLV",  
  "MINLPSolver" := "OAERAP" [  
    "MaxIterations" := 10000,  
    "OptimisationTolerance" := 0.0001,  
    "MILPSolver" := "GLPK",  
    "NLPSolver" := "IPOPT"  
  ]  
]
```

⊙ **Task:** NLP

⊙ **Interface:** ICapeMINLPSolverManager

⊙ **Status:** Standard interface

Additional example: MINLP solver

gPROMS Solution parameters:

```
DOSolver := "CVP_SS" [  
    "OutputLevel" := 0,  
    "DASolver" := "DASOLV",  
    "MINLPSolver" := "IPOPT",  
    "MaxIterations" := 10000,  
    "OptimisationMethod" := "NLP",  
    "OutputLevel" := 0,  
    "MILPSolver" := "GLPK",  
    "NLPSolver" := "IPOPT"  
]
```

Task: NLP

Interface: ICapeMINLPSolverManager

Status: Standard interface

Concluding remarks

- ◆ **CAPE-OPEN promotes standardisation of solvers for modular and equation-orientated modelling tools**
- ◆ **A wide variety of mathematical problem types to support a range of model-based activities**
 - ⇒ **simulation, optimisation, parameter estimation**
- ◆ **Support for state-of-the-art in numerical solvers**
 - ⇒ **interfaces make available all necessary information**
- ◆ **Enhance supply and usage of numerical solver technology from a variety of sources**
 - ⇒ **universities & research institutes**
 - ⇒ **specialist commercial providers**
- ◆ **Support development of more model-based applications**